



## Datos circulares con R

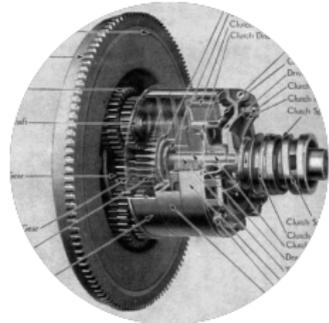
María Alonso Pena

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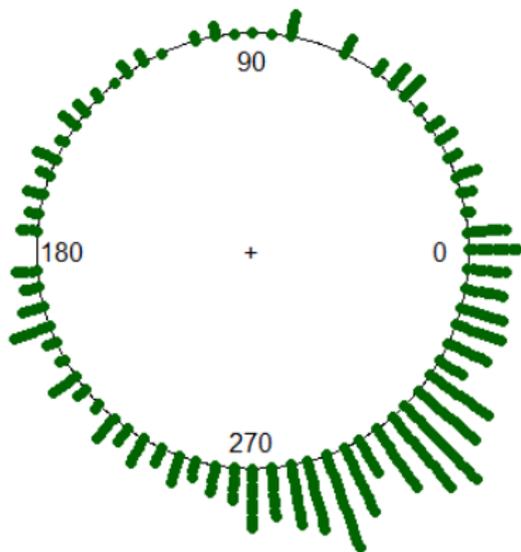
Universidade de Santiago de Compostela



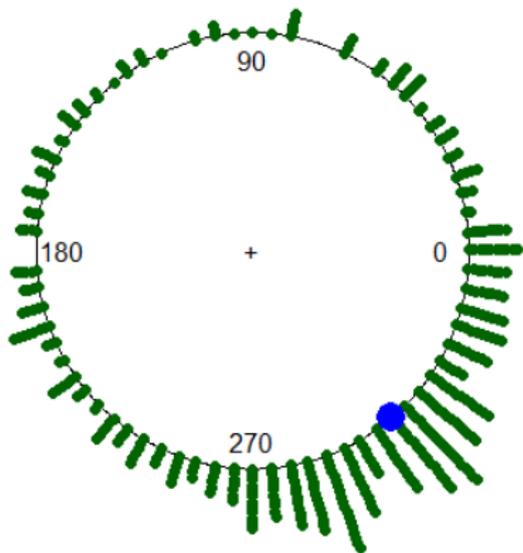
## Datos circulares



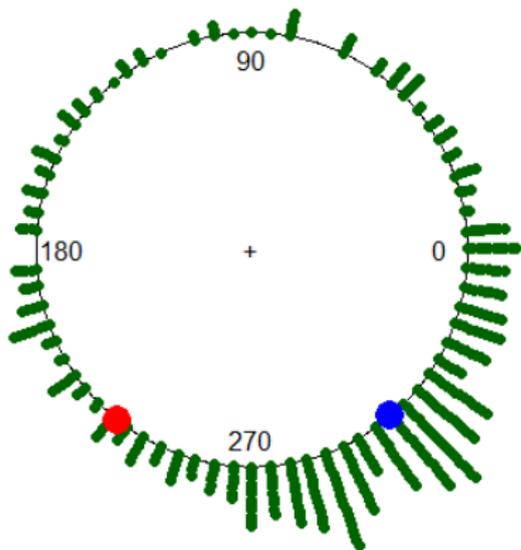
## Pulgas de praia



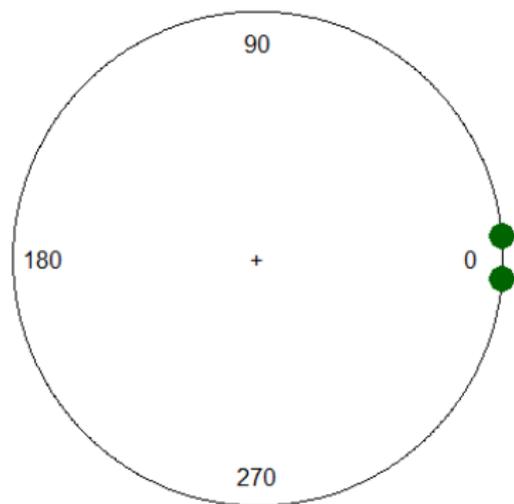
## Pulgas de praia



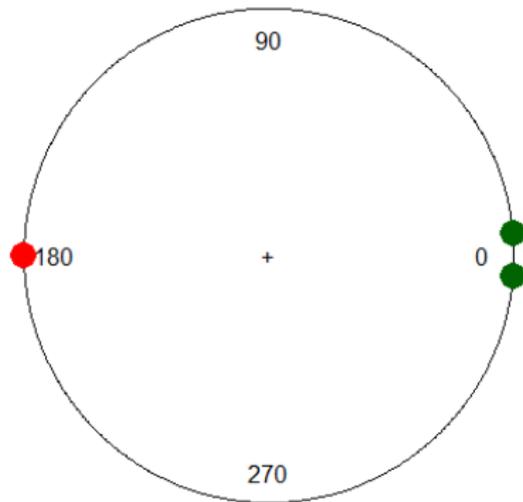
## Pulgas de praia



## Un ejemplo sinxelo

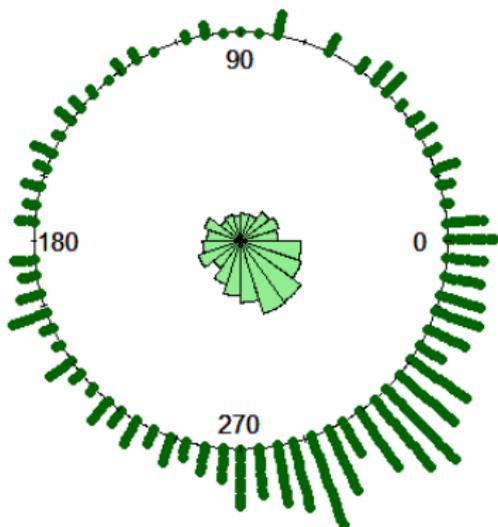


## Un ejemplo sinxelo





## Representando datos circulares



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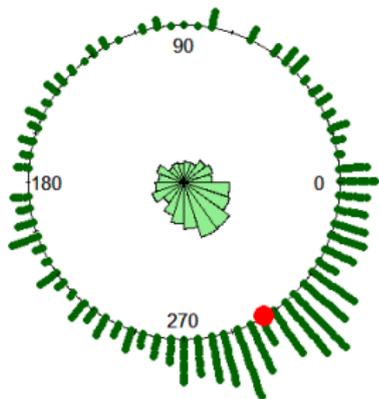
```
{circular}  
pulgas<-circular(pulgas,units="degrees")  
plot(pulgas,stack=T,col="darkgreen")  
rose.diag(pulgas,add=T, col="lightgreen")
```



## A media circular

$$\bar{\mu} = \text{atan2} \left( \frac{1}{n} \sum_{i=1}^n \sin \theta_i, \frac{1}{n} \sum_{i=1}^n \cos \theta_i \right)$$

$$\bar{\mu} = 301.0753$$



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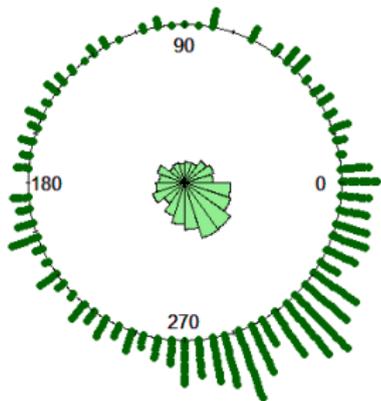
```
{circular}  
mean.circular(pulgas)
```



## Concentración dos datos

$$\bar{R} = \left( \left( \frac{1}{n} \sum_{i=1}^n \sin \theta_i \right)^2 + \left( \frac{1}{n} \sum_{i=1}^n \cos \theta_i \right)^2 \right)^{1/2}$$

$$\bar{R} = 0.4433$$

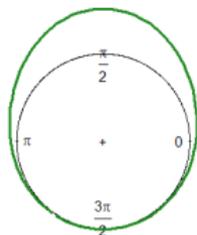


---

```
{circular}  
rho.circular(pulgas)
```

## Densidade circular: von Mises

$$f(\theta; \mu, \kappa) = \frac{1}{2\pi I_0(\kappa)} \exp(\kappa \cos(\theta - \mu))$$

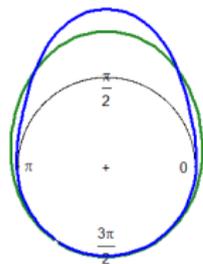


---

```
{circular}  
mu<-circular(pi/2)  
kappa<-2  
curve.circular(dvonmises(x,mu,kappa),lwd=3,col="forestgreen")
```

## Densidade circular: von Mises

$$f(\theta; \mu, \kappa) = \frac{1}{2\pi I_0(\kappa)} \exp(\kappa \cos(\theta - \mu))$$

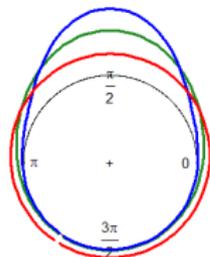


---

```
{circular}
mu<-circular(pi/2)
kappa<-2
curve.circular(dvonmises(x,mu,kappa),lwd=3,col="forestgreen")
kappa<-4
curve.circular(dvonmises(x,mu,kappa),add=T,lwd=3,col="blue")
```

## Densidade circular: von Mises

$$f(\theta; \mu, \kappa) = \frac{1}{2\pi I_0(\kappa)} \exp(\kappa \cos(\theta - \mu))$$

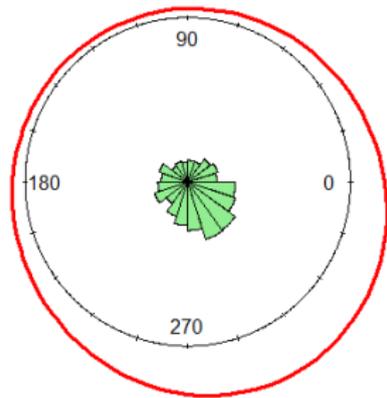


---

```
{circular}
mu<-circular(pi/2)
kappa<-2
curve.circular(dvonmises(x,mu,kappa),lwd=3,col="forestgreen")
kappa<-4
curve.circular(dvonmises(x,mu,kappa),add=T,lwd=3,col="blue")
kappa<-0.5
curve.circular(dvonmises(x,mu,kappa),add=T,lwd=3,col=2)
```



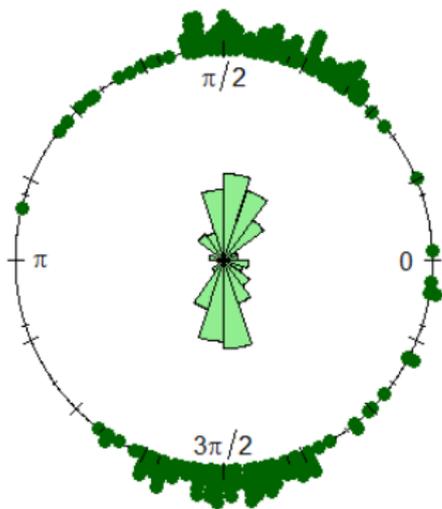
## Densidade circular: von Mises



---

```
{circular}  
mle.vonmises(pulgas,bias=TRUE)
```

## Cabalos do demo

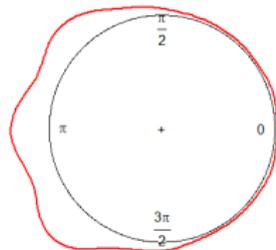


---

```
{NPCirc}  
data(dragonfly)  
plot(circular(dragonfly),stack=T,col="darkgreen")  
rose.diag(dragonfly,bins=20,add=T,col="lightgreen")
```

## Estimación tipo núcleo da densidade

$$\hat{f}_{\kappa}(\theta) = \frac{1}{n} \sum_{i=1}^n K_{\kappa}(\theta - \Theta_i)$$



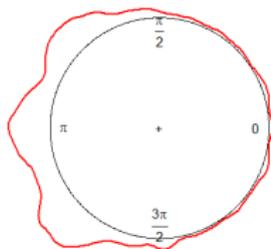
---

{NPCirc}

kern.den.circ(x, bw=50)

## Estimación tipo núcleo da densidade

$$\hat{f}_{\kappa}(\theta) = \frac{1}{n} \sum_{i=1}^n K_{\kappa}(\theta - \Theta_i)$$



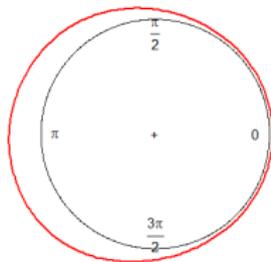
---

{NPCirc}

kern.den.circ(x,bw=200)

## Estimación tipo núcleo da densidade

$$\hat{f}_\kappa(\theta) = \frac{1}{n} \sum_{i=1}^n K_\kappa(\theta - \Theta_i)$$



---

{NPCirc}

kern.den.circ(x,bw=5)

## Selección do parámetro de suavizado

$$AMISE(\kappa) = \left\{ \frac{1}{16} \left[ 1 - \frac{I_2(\kappa)}{I_0(\kappa)} \right]^2 \int_0^{2\pi} [f''(\theta)]^2 d\theta + \frac{I_0(2\kappa)}{2n\pi(I_0(\kappa))^2} \right\}$$

- ▶ Regra do polgar
- ▶ Regra plug-in

- ▶ Validación cruzada
- ▶ Bootstrap

---

`{NPCirc}`

`bw.rt(x)`

`bw.pi(x)`

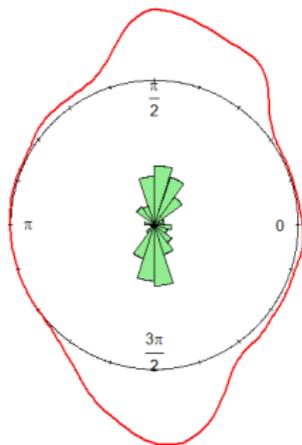
`bw.CV(x)`

`bw.boot(x)`

## Estimación tipo núcleo da densidade



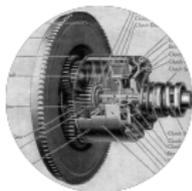
Density circular



N = 214 Bandwidth = 62.27 Unit = radians

```
{NPCirc}  
plugin<-bw.pi(dragonfly)  
kern.den.circ(dragonfly,bw=plugin)
```

## Regresión con variables circulares



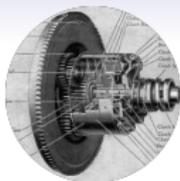
- ▶ Explicativa  $\Theta$ : ángulo de desequilibrio
- ▶ Resposta  $Y$ : peso corrector



- ▶ Explicativa  $X$ : distancia
- ▶ Resposta  $\Phi$ : dirección de migración

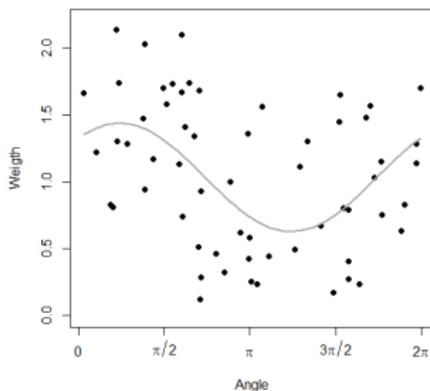
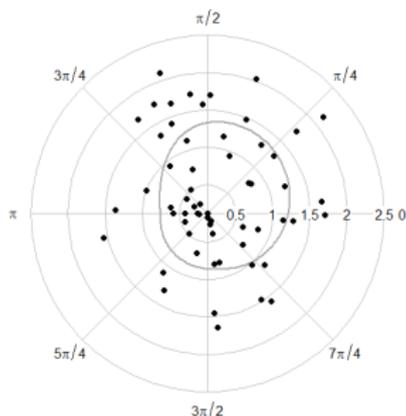


- ▶ Explicativa  $\Theta$ : dirección do vento ás 6am
- ▶ Resposta  $\Phi$ : dirección do vento ás 12am



## Regresión circular-lineal

$$Y_i = \beta_0 + \beta_1 \cos \Theta_i + \beta_2 \sin \Theta_i + \varepsilon_i$$



---

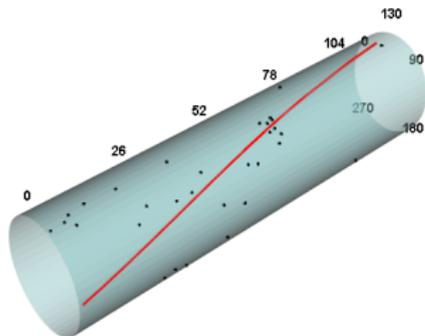
`lm(peso~sin(angulo)+cos(angulo))`



## Regresión lineal-circular

$$\Phi_i \sim vM(\mu_i, \kappa)$$

$$\mu_i = \gamma + 2 \tan^{-1}(\beta X_i)$$



---

`{circular}`

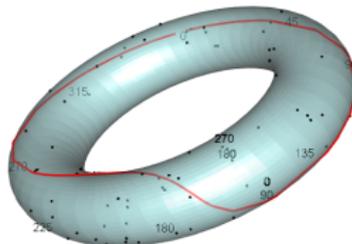
`lm.circular(type='c-1', y=cdirect, x=distance, init=0.0)`



## Regresión circular-circular

$$\cos(\Phi_j) = \gamma^c + \sum_{k=1}^p (\beta_k^c \cos(k\Theta_j) + \omega_k^c \sin(k\Theta_j)) + \varepsilon_j^c$$

$$\sin(\Phi_j) = \gamma^s + \sum_{k=1}^p (\beta_k^s \cos(k\Theta_j) + \omega_k^s \sin(k\Theta_j)) + \varepsilon_j^s$$



---

{circular}

```
lm.circular(type='c-c', y=noon, x=sixam, order=1)
```



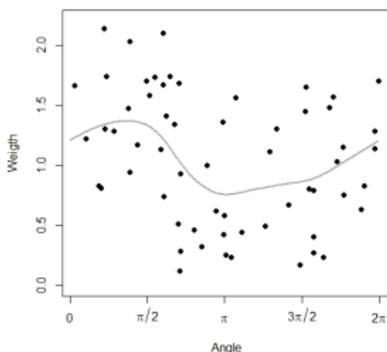
## Regresión tipo núcleo circular-lineal

- ▶ O modelo:

$$Y_j = m(\Theta_j) + \varepsilon_j$$

- ▶ Axuste trigonométrico **local**

$$\beta_0 + \beta_1 \sin(\Theta_j - \theta)$$



- ▶ Estimación:

$$(\hat{\beta}_0, \hat{\beta}_1) = \arg \min_{(a,b)} \sum_{j=1}^n K_{\kappa}(\theta - \Theta_j) [Y_j - (a + b \sin(\theta - \Theta_j))]^2$$

---

{NPCirc}

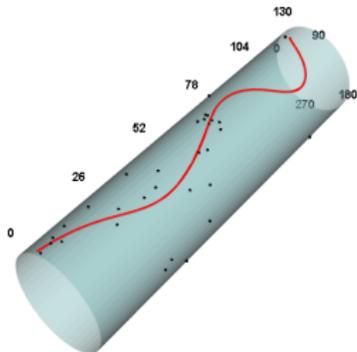
```
bwcv<-bw.reg.circ.lin(angulo,peso)
```

```
kern.reg.circ.lin(angulo,peso,bw=bwcv,method="LL")
```



## Regresión tipo núcleo linear-circular

$$\Phi_i = [m(X_i) + \varepsilon_i](\bmod 2\pi)$$



► Estimador:

$$\hat{m}(x) = \text{atan2}(\hat{g}_1(x), \hat{g}_2(x)),$$

$$\hat{g}_1(x) = \frac{1}{n} \sum \sin(\Phi_i) W_h(X_i - x), \quad \hat{g}_2(x) = \frac{1}{n} \sum \cos(\Phi_i) W_h(X_i - x)$$

---

`{NPCirc}`

```
bwcv<-bw.reg.lin.circ(distance,cdirect)
```

```
kern.reg.lin.circ(distance,cdirect,bw=bwcv,method="LL")
```



## Paquetes de R

- ▶ `circular`: manejo de datos circulares

- ▶ `NPCirc`: técnicas non paramétricas

Bonus:

- ▶ `directional`: manejo de datos direccionais



## Datos circulares con R

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